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CAINING 96195

D1-82-0219

## BOEING SCIENTIFIC RESEARCH LABORATORIES

# A Fast Procedure for Generating Normal Random Variables

296 195

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Mathematics Research

August 1962

## A FAST PROCEDURE FOR GENERATING NORMAL RANDOM VARIABLES

by

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Mathematical Note No. 282

Mathematics Research Laboratory

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August 1962

#### 1. Introduction

We will show how to generate normal random variables very rapidly in a computer - for example, at the rate of 10,000 - 15,000 per second in the IBM 7090. The method is suitable for any computer. It has evolved from a number of procedures we have considered in the past, [1] - [3]. The incorporation of successive improvements has led to a procedure which 1) is fairly easy to program, 2) requires little storage, 300 - 400 constants, 3) is very fast - it takes about as long to generate the normal x as the uniform u from which it comes, and 4) is completely accurate, in the sense that in theory the procedure returns a random variable with exactly the required distribution; in practice the result is an approximation influenced only by the capacity (word length) of the computer.

In short, our method is much faster than any we have heard of, and is completely accurate. We recommend that it be used as the basic normal random variable generator in any computer installation. Comparisons of methods, times, storage requirements, etc., are given in Section 4.

#### 2. The procedure for decimal computers

We will go into detail for the decimal case. The method for the binary case is similar and the necessary modifications will be given

in Section 3. Suppose we have a procedure for generating uniform [0,1] random variables u with, say, 8 decimal places. Then probably the fastest way to generate a variable x with absolutely continuous distribution F is to assign a value of x for each of the 108 possible u's according to the relation  $x = F^{-1}(u)$ . The time for generating x would then be the time to generate u, look up the value stored in the location associated with that u, and bring it to the required place. Unfortunately, this fastest procedure would require 108 storage locations. Our procedure approaches this ultimate in speed in the following way: 96 - 97% of the time, we use the first few digits of u to locate one of only a few hundred stored values, then we add the last digits of u to that stored value. The other 3 - 4% of the time, we do what is necessary to make the resulting mixture come out right. The average time for the entire procedure still remains close to the ultimate which can be attained by using 108 storage locations. The compact storage procedure which enables us to conserve storage space is described in [4].

Now for details of the method. Assume we have a procedure for producing independent uniform [0,1] random variables

u,u<sub>1</sub>,u<sub>2</sub>,u<sub>3</sub>,....

The problem is to generate a normal random variable X in terms of

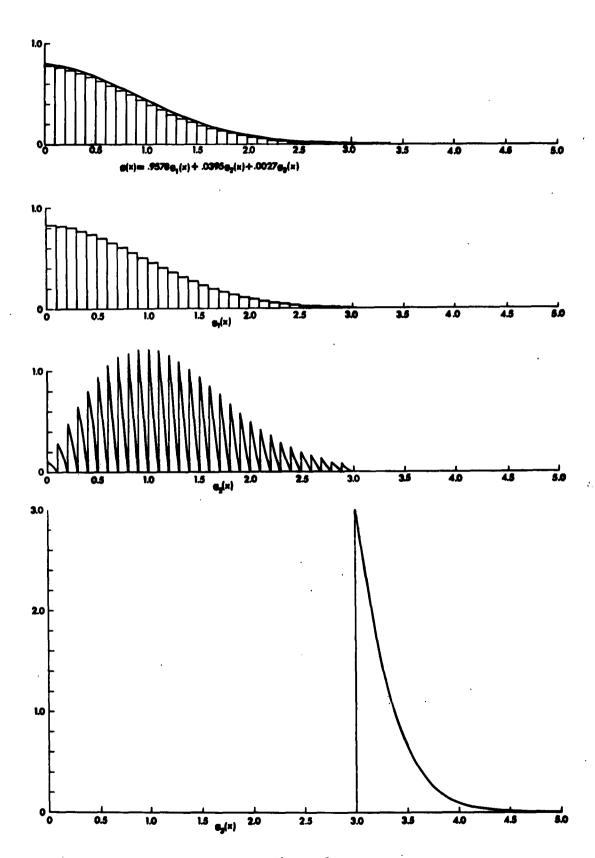


Figure 1.

the u's. Let g be the absolute normal density:

(1) 
$$g(x) = \frac{2e^{-\frac{1}{2}x^2}}{\sqrt{2\pi}}$$
  $x \ge 0$ 

The procedures below provide a random variable with density g; a random  $\pm$  must be attached at some convenient point in the program, or else, by doubling the storage requirements, the procedure may be modified to handle the standard normal density on  $-\infty < x < \infty$ .

We write g as a mixture of three densities, as pictured in Figure 1:

(2) 
$$g(x) = .9578g_1(x) + .0395g_2(x) + .0027g_3(x)$$
.

The probabilities displayed in (2) have been rounded to 4 places; they are actually used to 10 places in the program. With probability .9578... we generate a random variable with density  $g_1$ , with probability .0395... we generate a random variable with density  $g_2$ , and with probability .0027... we generate a random variable with density  $g_3$ . The time for  $g_1$  is very short, for  $g_2$  short, and for  $g_3$ , long.

We may produce a variable with density  $g_1$  in the form z + .lu, where z is discrete and u uniform [0,1]. The compact storage

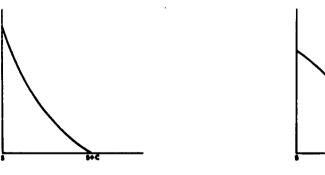
method described in [4] provides z quickly, with modest storage requirement. The altitudes of the rectangles in  $g_1$  are truncated to three decimal places for use in that method, the remaining portion is lumped with the toothlike region above the rectangle and dealt with directly on those infrequent occasions when it is required.

A variable with density  $g_2$ , required about 4 percent of the time, is produced as follows: One of the "teeth" from  $g_2$  is selected with appropriate probability, then a random variable with the nearly linear density given by that tooth is generated. The procedure, described in [3], is summarized as follows:

To generate a random variable X with a nearly linear density function g(x),  $s \le x \le s + c$ 

such as this

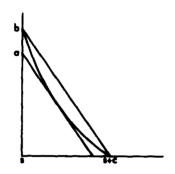
or this

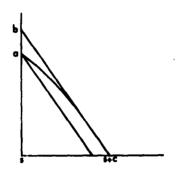


enclose g(x) within two parallel lines,

like this

or this.





#### Then:

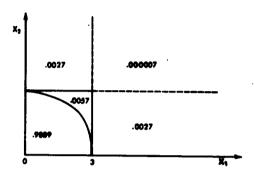
- 1. Choose independent uniform [0,1] random variables u and v.
- 2. If  $\max(u,v) \leq a/b$  put  $X = s + c \min(u,v)$ .
- 3. If not, test:  $b|u-v| \le g[s+c \min(u,v)]$ ? if yes, put  $X = s+c \min(u,v)$ ; if no, go to step 1 and try again.

In our application of this method, we have c = .1 and the test in step 3 may be put in the form

$$k|u-v| < e^{W} - 1$$
, where  $w = -\frac{1}{2}\{[s+.1 \min(u,v)]^2 - [s+.1]^2\}$   
and  $k = .1(s+.1)$  for  $s = 0,.1,.2,...,.9$  and  $k = e^{.1s+.005} - 1$  for  $s = 1.0,1.1,1.2,...,2.9$ .

The ratios a/b are stored in memory locations 230-259. Most of them are close to 1, so that step 2 of the nearly linear technique will provide X most of the time; only occasionally will an exponential subroutine be required.

Density  $g_3$  comes from the tail of g. It will provide our random variable about 1 time in 400. We then need an absolute normal variable, |x|, conditioned by |x| > 3. We get it by choosing one of a pair of absolute normal variables  $(x_1, x_2)$  lying in the first quadrant but outside the square:



We generate  $(x_1,x_2)$  by choosing a normal point outside the quarter circle, rejecting it if it lies inside the square. Thus, if  $u_1,u_2$  are independent, uniform [0,1], conditioned by  $u_1^2 + u_2^2 \le 1$ , we put

$$x_1 = u_1 \left[ \frac{9+2w}{u_1^2 + u_2^2} \right]^{\frac{1}{2}}$$

$$x_2 = u_2 \left[ \frac{9+2w}{u_1^2 + u_2^2} \right]^{\frac{1}{2}}$$

where w has the exponential distribution. We may provide w in the form  $-\ln(u_1^2+u_2^2)$ , since  $u_1^2+u_2^2$  is uniform [0,1] and is independent of  $\frac{u_1}{u_2}$  (see [5]). Then if  $(x_1,x_2)$  lies outside the square, we take whichever of the coordinates that is  $\geq 3$ . If both are  $\geq 3$ , we might possibly store one for future use, but the relative frequency for both  $\geq 3$ , about 1 in 800, is not enough to justify asking for a possible stored value. The measures of the regions are given in the figure, so that 54/(57+54), or about 49% of the time, a pair  $(x_1,x_2)$  lying outside the quarter-circle will lie outside the square.

Outline of the program: The following outline describes the procedure for a decimal machine, and the flow chart on the opposite page describes the same procedure with a little more detail. Assume that there is a subroutine for producing independent uniform [0,1] random variables  $u,u_1,u_2,\ldots$  on demand. Let the constants C(n) be stored in memory locations  $n=0,1,2,\ldots,289$ . Let  $\delta=10^{-1}$ . Let  $u=.d_1d_2d_3d_4d_5\ldots$  be the first u, the d's its decimal digits. Then:

1. If 
$$00 \le d_1 d_2 < 79$$
, put  $x = C(d_1 d_2) + .0d_2 d_5 d_6 ...$ 

2. If 
$$790 \le d_1 d_2 d_3 < 940$$
, put  $x = C(d_1 d_2 d_3 - 771) + .0d_2 d_5 d_6...$ 

3. If 
$$.94 \le u < .9973002039$$
, put J = 170 and go to step 5.

4. If  $.9973002039 \le u < 1$ , form pairs  $x_1, x_2$ :

$$x_1 = u_1 \left[ \frac{3^2 - 2 \ln(u_1^2 + u_2^2)}{u_1^2 + u_2^2} \right]^{\frac{1}{2}}$$

$$\mathbf{x}_{2} = \mathbf{u}_{2} \left[ \frac{3^{2} - 2 \ln(\mathbf{u}_{1}^{2} + \mathbf{u}_{2}^{2})}{\mathbf{u}_{1}^{2} + \mathbf{u}_{2}^{2}} \right]^{\frac{1}{2}}$$

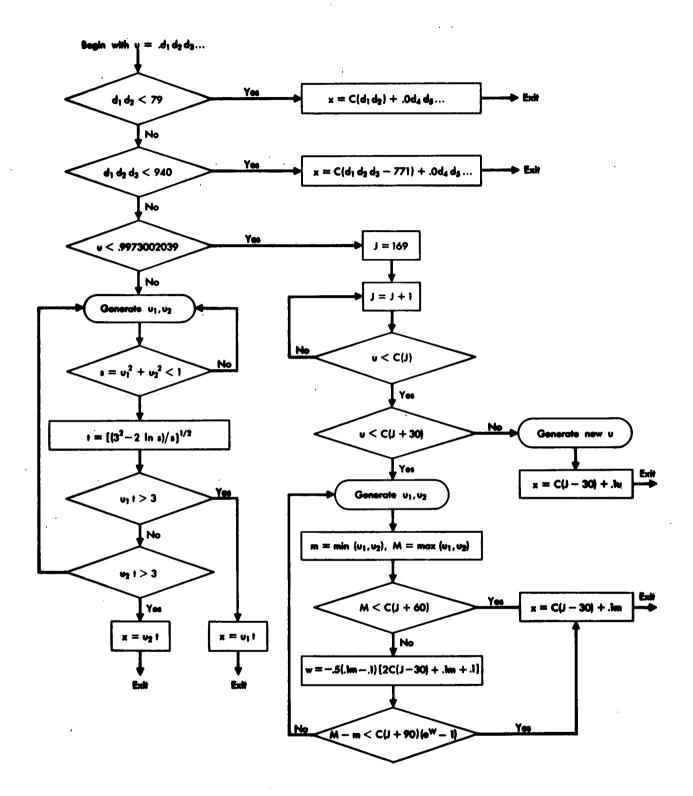
until one of the pair  $x_1, x_2$  is  $\geq 3$ , and let that be x;  $u_1$  and  $u_2$  are conditioned by  $u_1^2 + u_2^2 \leq 1$ .

- 5. Test: Is u < C(J)? If yes, go to step 6. If no, put J = J + 1 and repeat step 5.
- 6. Test: Is u < C(J + 30)? If yes, go to step 8. If no, go to step 7.
- 7. Generate new u and put  $x = C(J 30) + \delta u$ .
- 8. Generate new  $u_1, u_2$ . Test: Is  $\max(u_1, u_2) < C(J + 60)$ ? If yes, put  $x = C(J 30) + \delta \min(u_1, u_2)$ . If no, let

$$w = -.5[C(J - 30) + \delta \min(u_1, u_2)]^2 - [C(J - 30) + \delta]^2$$

and test: Is  $|u_1 - u_2| < C(J + 90)(e^W - 1)$ ? If yes, put  $x = C(J - 30) + \delta \min(u_1, u_2)$ . If no, repeat step 8.

To generate a normal variable X in a decimal computer:



#### Constants for Loading in Memory of a Decimal Machine

```
Location
            Contents
                                                                                      .973
                                                                 .9422781966
                                                                                 250
    Ò
        0.2
                                           0.5
                                                           200
                   0.5
                                      150
               50
                          100
                               1.6
                                                                                      .975
                                                                                 251
                                                           201
                                                                 .9455720777
        0.2
                                      151
                                           1.2
    1
               51
                   0.6
                          101
                               1.6
                                                                                      .974
                                                                 .9485514463
                                                                                 252
                                                           202
                                      152
                                            1.6
        0.3
               52
                   0.7
                          102
                               1.6
                                                                                 253
                                                                                      .978
                                                           203
                                                                 .9511653133
        0.3
                               1.6
                                      153
                                            1.7
               53
                   0.7
                          103
                                                                                      .755
                                                                 .9549863293
                                                                                 254
                                                           204
    4
        0.3
               54
                   0.7
                          104
                               1.7
                                      154
                                            0.3
                                                                                      .970
                                                                                 255
                                                           205
                                                                 .9566914271
    5
        0.3
               55
                               1.7
                                      155
                                            1.5
                   0.7
                          105
                                                                                 256
                                                                                      .501
    6
                                                           206
                                                                 .9604850173
                                      156
                                            2.0
        0.3
                               1.7
               56
                   0.7
                          106
                                                                                      .971
                                                                                 257
                                            1.8
                                                           207
                                                                 .9638041343
    7
                                      157
        0.5
                               1.8
               57
                   0.8
                          107
                                                                 .9665717757
                                                                                 258
                                                                                      .968
    8
                                                            208
                                            2.2
               58
                               1.9
                                      158
        0.6
                   0.8
                          108
                                                                 .9689169701
                                                                                 259
                                                                                      .967
                                                            209
    9
               59
                                            0.2
        0.6
                   0.9
                          109
                               1.9
                                      159
                                                                                 260
                                                                                      12.5
                                                            210
                                                                 .9712916782
    10
        0.6
               60
                   0.9
                          110
                               1.9
                                      160
                                            2.5
                                                                 .9742012516
                                                                                 261
                                                                                      8.20523339
                                                            211
                                      161
                                            2.3
    11
        0.6
               61
                   0.9
                          111
                               1.9
                                                                                      6.91865398
                                                            212
                                                                 .9761328124
                                                                                 262
    12
        0.6
               62
                   0.9
                          112
                               1.9
                                      162
                                            2.4
                                                            213
                                                                 .9784228835
                                                                                 263
                                                                                      20.0
        0.8
                               1.9
                                      163
                                            2.1
    13
               63
                          113
                   1.0
                                                            214
                                                                 .9805795259
                                                                                 264
                                                                                     9.03255791
        0.8
                               1.9
                                      164
                                            0.1
    14
               64
                   1.0
                          114
                                                            215
                                                                 .9830652062
                                                                                 265
                                                                                      4.6444483
                                            2.7
    15
         0.8
               65
                                1.9
                                      165
                   1.1
                          115
                                                                 .9842240767
                                                                                      6.40863082
    16
                                                            216
                                                                                 266
                                      166
                                            0.0
        1.0
               66
                    1.1
                          116
                                2.0
                                                                 .9863251515
                                                            217
                                                                                 267
                                                                                      10.0
                                            2.6
    17
        1.0
               67
                   1.1
                                2.0
                                       167
                          117
                                                                 .9871415820
                                                            218
                                                                                 268
                                                                                      11.11111111
    18
               68
                                       168
                                            2.8
        1.5
                   1.2
                          118
                                2.0
                                                            219
                                                                  .9888328519
                                                                                 269
                                                                                      14.2857142
    19
         0.0
               69
                   1.2
                          119
                                2.0
                                       169
                                            2.9
                                                                                      16.6666666
                                            .9432165072
                                                            220
                                                                  .9894907759
                                                                                 270
                                      170
    20
        0.0
               70
                   1.2
                          120
                                2.0
                                            .9464092887
                                                            221
                                                                  .9907816118
                                                                                 271
                                                                                      7.51041395
    21
         0.0
                    1.3
                          121
                                2.0
                                       171
               71
                                                                                       5.57434982
                                                            222
                                                                  .9917305989
                                                                                 272
                                            .9494969394
    22
         0.0
               72
                    1.3
                          122
                                2.0
                                       172
                                                            223
                                                                  .9930632865
                                                                                 273
                                                                                       5.22886160
                                            .9525783787
    23
         0.0
                          123
                                2.1
                                       173
               73
                    1.4
                                                                  .9938134106
                                                                                 274
                                                                                      25.0
                                             .9555567647
                                                            224
    24
                                       174
         0.0
               74
                    1.4
                          124
                                2.1
                                                                                       5.96452440
                                                                  .9942625460
                                                                                 275
                                             .9584896204
                                                            225
    25
         0.0
               75
                          125
                                2.1
                                       175
                    1.5
                                                                                       4.39512015
                                             .9613885364
                                                            226
                                                                  .9951108014
                                                                                 276
    26
               76
                          126
                                2.1
                                       176
         0.1
                    1.6
                                                                  .9958055523
                                                                                 277
                                                                                       4.92081328
                                             .9641982792
                                                            227
    27
         0.1
                    1.7
                          127
                                2.1
                                       177
               77
                                                                  .9960778669
                                                                                       3.96317864
                                             .9667888257
                                                            228
                                                                                 278
    28
         0.1
                78
                    1.8
                          128
                                2.1
                                       178
                                                                  .9964138342
                                                                                 279
                                                                                       33.33333333
                                                            229
                                             .9693677568
    29
               79
                    0.0
                          129
                                2.2
                                       179
         0.1
                                                                  .973
                                                                                 280
                                                                                       3.44279563
                                                            230
                               2.2
                                       180
                                             .9719365988
    30
         0.1
               80
                    0.4
                          130
                                                                                 281
                                                                                       3.77488448
                                                                  .996
                    0.4
                                             .9744749700
                                                            231
                           131
                                2.2
                                       181
    31
         0.1
               81
                                                                                 282
                                                                                       3.60202892
                                             .9769426279
                                                            232
                                                                  .992
                                       182
                    0.7
                           132
                                2.2
    32
         0.1
               82
                                                                  .920
                                                                                 283
                                                                                       4.16906566
                                             .9792129152
                                                            233
                    0.9
                           133
                                2.3
                                       183
     33
         0.2
               83
                                                                  .998
                                                                                 284
                                                                                       50.0
                                                            234
                                       184
                                             .9812335540
    34
         0.2
                84
                    0.9
                           134
                                2.3
                                                                                 285
                                                                                       3.15925147
                                             .9832493731
                                                            235
                                                                  .982
     35
         0.2
                85
                    0.9
                           135
                                2.3
                                       185
                                                                                 286
                                                                                      100.0
                                                             236
                                                                  .990
     36
                           136
                                2.4
                                       186
                                             .9850207959
         0.2
                86
                    1.1
                                                                                 287
                                                                                       3.29564243
                                       187
                                             .9864483145
                                                             237
                                                                  -996
     37
         0.2
                    1.1
                           137
                                2.4
                87
                                                                                       3.03248984
                                                                                 288
                                             .9878069895
                                                             238
                                                                  .985
     38
                           138
                                2.5
                                       188
         0.3
                88
                    1.1
                                                                                       2.91437825
                                                                  .959
                                                                                 289
     39
                                             .9891104150
                                                             239
                89
                           139
                                2.6
                                       189
         0.3
                    1.1
                                             .9902073697
                                                             240
                                                                  .942
                                0.7
                                       190
     40
         0.4
                90
                    1.3
                           140
                                                                  .994
                                             .9912605179
                                                             241
     41
         0.4
                91
                    1.3
                           141
                                1.1
                                       191
                                                             242
                                                                  .986
     42
                92
                    1.3
                           142
                                1.3
                                       192
                                             .9922362590
         0.4
                                                             243
                                                                   .985
     43
                           143
                                       193
                                             .9931582051
         0.4
                93
                    1.3
                                0.4
                                             .9940219494
                                                             244
                                                                   .890
                    1.3
                           144
                                1.0
                                       194
     44
         0.4
                94
                                                                   .988
     45
                95
                                             .9948456363
                                                             245
         0.4
                    1.3
                           145
                                1.9
                                       195
                                                                   .980
                                                             246
                                             .9955013109
     46
         0.5
                96
                    1.4
                           146
                                 1.4
                                       196
                                                                   .983
                                                             247
     47
         0.5
                97
                    1.4
                           147
                                 0.9
                                        197
                                             .9958897393
                                                                   .977
                                                             248
     48
         0.5
                98
                    1.6
                           148
                                 0.8
                                        198
                                             .9962683734
     49
         0.5
                99
                    1.6
                           149
                                 0.6
                                       199
                                             .9973002039
                                                             249
                                                                   .843
```

#### 3. The procedure for binary computers

The method for binary machines is much the same as for the decimal case; the constants change, of course, and the first four octal digits of u are used to locate a discrete variable, rather than the first three in the decimal case. The binary program requires 456 storage locations (456 base 10 = 707 base 8). Here is the outline for a binary machine; all numbers in the outline are octal except the number of the step:

Let  $u = .b_1b_2b_3b_4b_5...$  be a uniform [0,1] random variable, the b's its octal digits. Let the constants C(n) be stored in memory locations n = 0,1,2,...,707. Let  $\delta = 2^{-4}$ .

1. If 
$$00 \le b_1b_2 < 54$$
, put  $x = C(b_1b_2) + (.b_5b_6...)$ 

2. If 
$$540 \le b_1b_2b_3 < 733$$
, put  $x = C(b_1b_2b_3 - 506) + (.b_5b_6...)$ 

3. If 
$$7330 \le b_1b_2b_3b_4 < 7571$$
, put  $x = C(b_1b_2b_3b_4 - 7161) + (.b_5b_6...)$ 

4. If 
$$.7571 \le u < .776474207403$$
, put J = 330 and go to step 6.

5. If 
$$.776474207403 \le u < 1$$
, form pairs  $x_1, x_2$ :

$$x_1 = u_1 \left[ \frac{3^2 - 2 \ln u_3}{u_1^2 + u_2^2} \right]^{\frac{1}{2}}$$
  $x_2 = u_2 \left[ \frac{3^2 - 2 \ln u_3}{u_1^2 + u_2^2} \right]^{\frac{1}{2}}$ 

until one of the pair  $x_1, x_2$  is  $\geq 3$ , and let that be  $x; u_1$  and  $u_2$  are conditioned by  $u_1^2 + u_2^2 \leq 1$ .

6. Test: Is u < C(J)? If yes, go to step 7. If no, put J = J + 1 and repeat step 6.

7. Test: Is u < C(J + 60)? If yes, go to step 9. If no, go to step 8.

8. Generate new u and put  $x = C(J - 60) + \delta u$ .

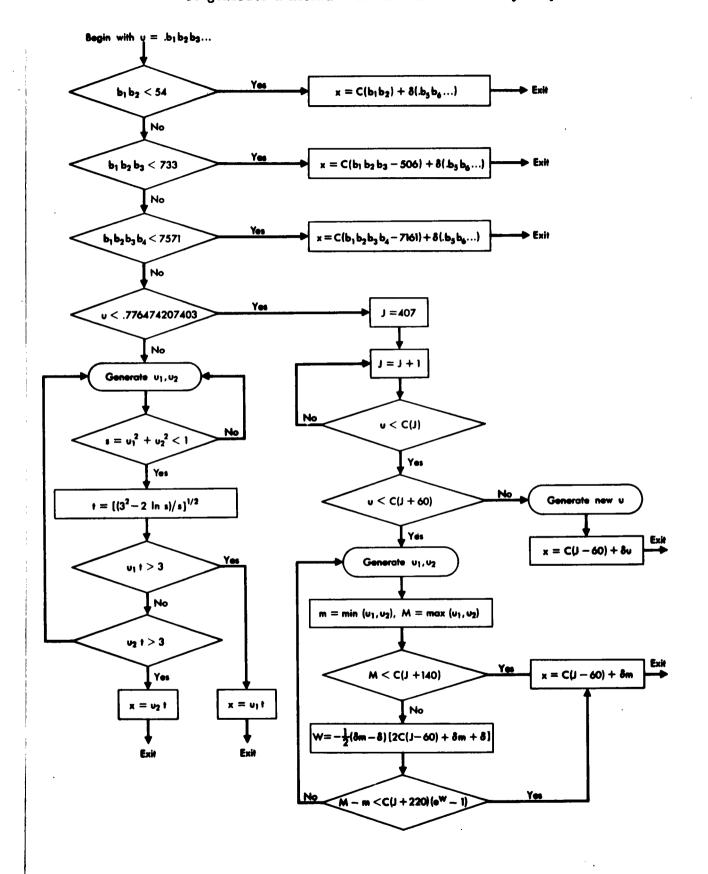
9. Generate new  $u_1, u_2$ . Test: Is  $\max(u_1, u_2) < C(J + 140)$ ? If yes,

put 
$$x = C(J - 60) + \delta \min(u_1, u_2)$$
. If no, let

$$w = -.5[C(J - 60) + \delta \min(u_1, u_2)]^2 - [C(J - 60) + \delta]^2$$

and test: Is  $|u_1 - u_2| < C(J + 220)(e^W - 1)$ ? If yes, put  $x = C(J - 60) + \delta \min(u_1, u_2)$ . If no, repeat step 9.

To generate a normal variable X in a binary computer:



2.64 2.74 0.50 1.34 0.14 2.40 2.20 .757560405673 .760234424060 .760676236473 .766540571732 .767057376151 .767362761001 .767661723253 .762374711576 .763403057403 765341272422 765671312356 766220112235 761757765014 764374663551 764761323555 771401242447 770433574421 77162705477 **74243472 ~858888888888888888888888888888888** 

Constants for Loading in Memory of a Binary Machine

Contents

Location

Constants for Loading in Memory of a Binary Machine (Continued)

nts
Contents
_
Location
Loc

5.11022055440 4.71724514567 27.2135056427 12.3153453106 100.000000000 7.11613341352	5.65305743000 6.41506050024	14
<b>8</b> 4 8 8 4 8 9 8 9 9 9 9 9 9 9 9 9 9 9 9 9	707	
12.7051277344 13.7751302113 13.3237507547 25.25252525 11.4302476301 34.3434343435	11.7517535166 31.4631463146 44.444444445 40.00000000000 11.1264167105 10.3736103657 10.6426544257 52.52525253	7.50620734567 10.1400214133 63.1463146315 7.71641453111 6.73473744531 7.30631455432 125.252525253 5.77466772305 6.56205271365 200.000000000 6.12270336161 5.21066362026 400.0000000000 6.25540044013 5.31431256077 5.53521465767 5.42310106110
	655 655 655 655 655 655 655 655 655 655	655 655 655 655 655 655 655 655 655 655
.720305 .772274 .770652 .771260 .654426	.770652 .601014 .767636 .766213 .400000 .770244 .766213	.76621 .76517 .765605 .765177 .762540 .774325 .771260 .771260 .770244 20.0000000000 15.2600345420 23.5423542354 21.0421042104 16.1045753441 14.5047100265 22.22222222
8588548	86555555555555555555555555555555555555	\$
1115 1115 1115 1115 1115 1115 1115 111	. н. н	
.774625742514 .774665775115 .775241167360 .775574501203 .7757753645433	.776310245131 .776466327471 .776764 .776355 .770244 .774733	.772702 .777372 .775747 .775747 .775341 .753412 .773405 .774065 .773311 .732071 .732071
	546 .77631024513 547 .77646632747 550 .776764 551 .776355 552 .770244 553 .774733 554 .776764	
777777 777777 777777	252 252 253 253 253 253 254 254 255 255 255 255 255 255 255 255	55 55 55 55 55 55 55 55 55 55 55 55 55
.763727170426 540 .764350307335 541 .764731761350 542 .765325542625 543 .765626262733 544 .766170332156 545	252 252 253 253 253 253 254 254 255 255 255 255 255 255 255 255	.T71330110360 556 .T71611062622 557 .T72011173326 560 .T72247442063 561 .T72415035317 562 .T724460000 565 .T73124460000 565 .T73336707062 566 .T73431074735 567 .T73571235677 570 .T73656531334 571 .T74155267577 573 .T74223170530 574 .T74341106310 576 .T74523200672 577
.772052635207 500 .7637271.70426 540 .772270311551 501 .764350307335 541 .772467634533 502 .764731761350 542 .772665647261 503 .765325542625 543 .773045553544 504 .7656262733 544 .773222754052 505 .766170332156 545	506 .766520025576 546 507 .767056242601 547 510 .767313406006 550 511 .767641337232 551 512 .770133535457 552 513 .770372353604 553 514 .770672114354 554 515 .771115102463 555	.774502233714 516 .771330110360 556 .774602052000 517 .771611062622 557 .7714617326 560 .7714617336 560 .7714617336 560 .7714617157165 521 .772247442063 561 .77526222404 522 .772247442063 561 .775262224043 522 .77224744203317 562 .77562521736 523 .772247460000 565 .776237170444 525 .773124460000 565 .77636212163 521 .7734317720677 570 .760141624142 531 .773456531334 571 .760141624142 531 .773772067714 572 .760141624142 531 .773772067714 572 .760141624142 531 .773772067714 572 .76014150417 533 .774155267577 573 .7601721150613 534 .7743410106310 576 .762333662456 535 .774341106310 576 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .763371074044 537 .774523200672 577 .774523777 .774523200672 5774 .774

#### 4. Remarks

The fast parts of the program, steps 1 - 2 for the decimal and 1 - 3 for the binary, are used most of the time. They should be written in machine language, with care. A procedure for assigning a random + must be incorporated, too. The remaining steps can be written in FORTRAN or some such language with little effect on the average running time.

We have written programs based on this procedure for the IBM 1620 (decimal), and the IBM 7090 (binary) machines. The programs are written as standard FORTRAN function subprograms with the necessary linkages, setting index registers, returning X in normalised floating form, etc. In the IBM 7090, each call to the subroutine for a normal variable requires about 50 cycles, which gives a rate of about 10,000 per second. If the procedure is incorporated in a larger program and not written as a standard subroutine, then rates of about 15,000 per second are possible. The standard subroutine for the IBM 7090 requires about 1,300 storage locations, including the space for the constants and for the instructions.

The IBM 1620 decimal machine is quite a bit slower. The above procedure, written as a standard FORTRAN subprogram for that machine, with necessary linkages, returning X in normalized floating point form, etc., takes about 20 milliseconds. The constants and the instructions require about 4,000 core storage positions.

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